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 CPSC 335 Project 3

## Project 3 Report

### Mathamatical Analysis:

#### ----- Exhaustive Method -----

```
std::shared_ptr<Protein> exhaustive_best_match(ProteinVector & proteins, const
std::string & string1)
{
    int best_i = 0; //O(1)
    int best_score = 0; //O(1)
    for (int i = 0; i < proteins.size(); i++) //O(n)
    {
        int score = exhaustive_longest_common_subsequence(proteins[i]->sequence, string1); //O(2(2^n(n))+n^2)
        if (score > best_score) //O(1)
        {
            best_score = score; //O(1)
            best_i = i; //O(1)
        }
    }
    return proteins[best_i]; //O(1)
}
```

#### exhaustive\_best\_match Mathamatical Analysis:

$$\begin{aligned}
 &= O(1 + 1 + n((2(2^n(n)) + n^2) + 1 + 1) + 1) \\
 &= O(3 + n((2(2^n(n)) + n^2) + 2)) \\
 &= O(n(2(2^n(n)) + n^2) + 2) \\
 &= O(2n(2^n(n)) + n^2)
 \end{aligned}$$

$$\text{Lemma: } (3 + n((2(2^n(n)) + n^2) + 2))$$

$$\lim_{n \rightarrow \infty} \left( \frac{T(n)}{f(n)} \right) = \lim_{n \rightarrow \infty} \left( \frac{T(3 + n((2(2^n(n)) + n^2) + 2))}{f(2n(2^n(n)) + n^2)} \right) = 1$$

$$\therefore 3 + n((2(2^n(n)) + n^2) + 2) \in O((2n(2^n(n)) + n^2))$$

```
int exhaustive_longest_common_subsequence(const std::string & string1,
const std::string & string2)
{
    auto all_subseqs1 = generate_all_subsequences(string1); //O(2^n(n))
    auto all_subseqs2 = generate_all_subsequences(string2); //O(2^n(n))
    int best_score = 0; //O(1)
    for (auto& s1 : *all_subseqs1) //O(n)
    {
        for (auto& s2 : *all_subseqs2) //O(n)
        {
            if (s1 == s2 && s1.length() > best_score) //O(c)
                best_score = s1.length(); //O(c)
        }
    }
    return best_score; //O(1)
}
```

#### Exhaustive\_longest\_common\_subsequences Mathamatical Analysis:

$$\begin{aligned}
 &= O((2^n(n)) + (2^n(n)) + 1 + n(n(c+c)) + 1) \\
 &= O((2^n(n)) + (2^n(n)) + 2 + n(n(2c))) \\
 &= O((2^n(n)) + (2^n(n)) + n^2)
 \end{aligned}$$

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$$=O(2(2^n(n)) + n^2)$$

```
std::unique_ptr<std::vector<std::string>> generate_all_subsequences(const std::string
& sequence)
{
    auto R = std::unique_ptr<std::vector<std::string>>(new std::vector<std::string>());
    //O(c)
    double n = pow(2, sequence.length()); //O(c)
    for (uint64_t bits = 0; bits < n; bits++) //O(2^n)
    {
        std::string subsequence = ""; //O(1)
        for (int j = 0; j < sequence.length(); j++) //O(n)
            if (((bits >> j) & 1) == 1) //O(c)
                subsequence += sequence[j]; //O(c)
        R->push_back(subsequence); //O(1)
    }
    return R; //O(1)
}
```

#### generate\_all\_subsequences Mathamatical Analysis:

$$\begin{aligned}
 &=O(c + c + 2^n(1 + n(c + c) + 1) + 1) \\
 &=O(2c + 1 + 2^n(2 + n(2c))) \\
 &=O(2c + 2^n(n(2c))) \\
 &=O(2^n(n))
 \end{aligned}$$

#### ----- Dynamic Programming -----

```
std::shared_ptr<Protein> dynamicprogramming_best_match(ProteinVector & proteins, const
std::string & string1)
{
    int best_i = 0; //O(1)
    int best_score = 0; //O(1)
    for (int i = 0; i < proteins.size(); i++) //O(n)
    {
        int score = dynamicprogramming_longest_common_subsequence(proteins[i]->sequence, string1); //O(k + m + km^2)

        if (score > best_score) //O(1)
        {
            best_score = score; //O(1)
            best_i = i; //O(1)
        }
    }
    return proteins[best_i]; //O(1)
}
```

#### dynamicprogramming\_best\_match Mathamatical Analysis:

$$\begin{aligned}
 &=O(1 + 1 + n((k + m + km^2)(1+1+1)) + 1) \\
 &=O(3 + n(k + m + km^2)(3)) \\
 &=O(n(k + m + km^2))
 \end{aligned}$$

$$\text{Lemma: } (3 + n(k + m + km^2)(3))$$

$$\lim_{n \rightarrow \infty} \left( \frac{T(n)}{f(n)} \right) = \lim_{n \rightarrow \infty} \left( \frac{3 + n(k + m + km^2)}{n(k + m + km^2)} \right) = 1$$

$$\therefore (3 + n(k + m + km^2)(3)) \in O(n(k + m + km^2))$$

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```
int dynamicprogramming_longest_common_subsequence(const std::string & string1,
    const std::string & string2)
{
    int n = string1.length();           //O(c)
    int m = string2.length();           //O(c)
    std::vector<std::vector<int>>>D(n + 1, std::vector<int>(m + 1)); //O(c)
    for (int i = 0; i < n; i++)          //O(k)
        D[i][0] = 0;                    //O(1)
    for (int j = 0; j < m; j++)          //O(m)
        D[0][j] = 0;                    //O(1)

    for (int i = 1; i <= n; i++)          //O(k)
    {
        for (int j = 1; j <= m; j++)      //O(m)
        {
            int up = D[i - 1][j];        //O(c)
            int left = D[i][j - 1];       //O(c)
            int diag = D[i - 1][j - 1];   //O(c)
            if (string1[i - 1] == string2[j - 1]) //O(c)
                diag++;                  //O(1)
            int intermediate = std::max(up, left); //O(c)
            D[i][j] = std::max(intermediate, diag); //O(c)
        }
    }
    return D[n][m];                      //O(1)
}
```

#### **dynamicprogramming\_longest\_common\_subsequence Mathamatical Analysis:**

$$\begin{aligned}
 &= O(c + c + k(1) + m(1) + k(m(c + c + c + c + 1 + c + c) + 1)) \\
 &= O(2c + k + m + km(6c + 1) + 1) \\
 &= O(2c + k + m + km(6c + km) + 1) \\
 &= O(k + m + km(km)) \\
 &= O(k + m + km^2)
 \end{aligned}$$

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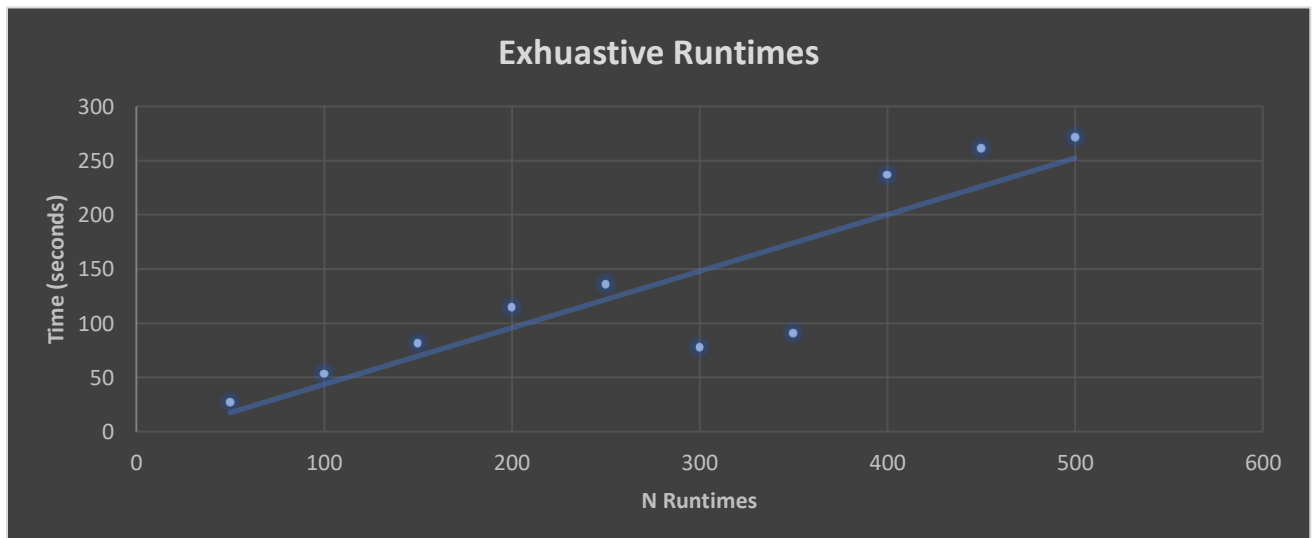
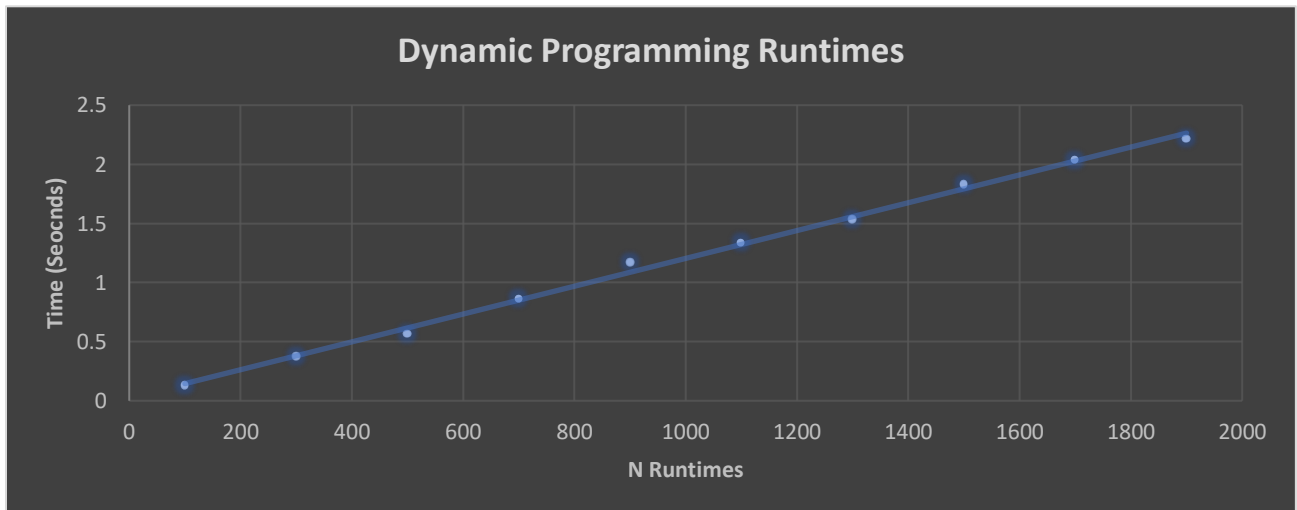
### Empirical Analysis:

#### Dynamic Method:

n runtimes	time (seconds)
100	0.130544
300	0.375181
500	0.566103
700	0.860546
900	1.16766
1100	1.33538
1300	1.53265
1500	1.82574
1700	2.03512
1900	2.21351

#### Exhaustive Method:

n runtimes	time (seconds)
50	27.0331
100	53
150	81.3127
200	114.377
250	135.794
300	77.7037
350	90.6967
400	236.573
450	261.121
500	271.481



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## Conclusion

### Exhaustive Match Results:

sp|P08521|AAP\_YEAST  
sp|Q02336|ADA2\_YEAST  
sp|P08521|AAP\_YEAST  
sp|P14164|ABF1\_YEAST  
sp|P19414|ACON\_YEAST

### Dynamic Match Results:

sp|P32469|DPH5\_YEAST  
sp|P32469|DPH5\_YEAST  
sp|P32469|DPH5\_YEAST  
sp|P32469|DPH5\_YEAST  
sp|Q08032|CDC45\_YEAST

3) The results that we generated did not all match to the protein. Essentially, because its looking for two strings that matches, and both algorithms are looking for the longest subsequence, and when it finds them the two will ignore strings of equal length.

4) Our empirically-observed time efficiency data is consistent with the mathamatically derived big-O efficiency class of the dynamic programming algorithm. However, our empirically-observed data isn't as consistent with out mathamatically derived big-O efficiency class of the exhaustive algorithm.